



ALBERT-LUDWIGS-
UNIVERSITÄT FREIBURG

Algorithms for Radio Networks

Network Coding

University of Freiburg
Technical Faculty
Computer Networks and Telematics
Christian Schindelhauer



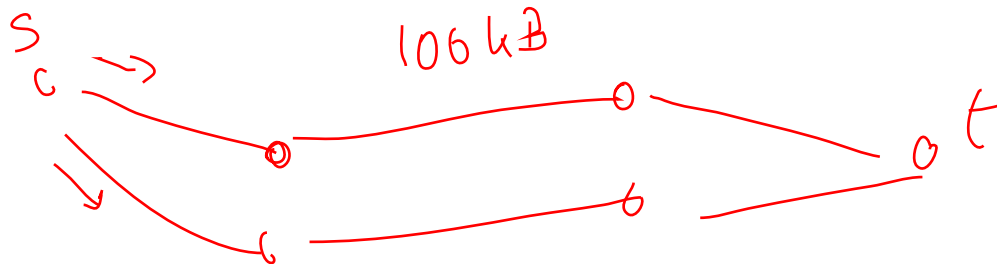
Data Flows in Networks

► Motivation

- Optimize data flow from source to target

► Definition:

- (Single-commodity) maximum flow problem
- Given
 - a graph $G=(V,E)$
 - a capacity function $w:E \rightarrow \mathbb{R}_0^+$,
 - source set S and target set T
- Find a maximum flow from S to T



► A flow is a function

$f : E \rightarrow \mathbb{R}_0^+$ such that

- for all $e \in E$: $f(e) \leq w(e)$
- for all $e \notin E$: $f(e) = 0$

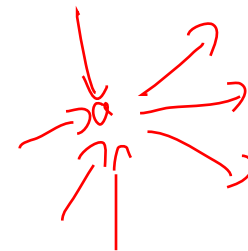
- for all $u, v \in V$: $f(u, v) \geq 0$

$$\forall u \in V \setminus (S \cup T)$$

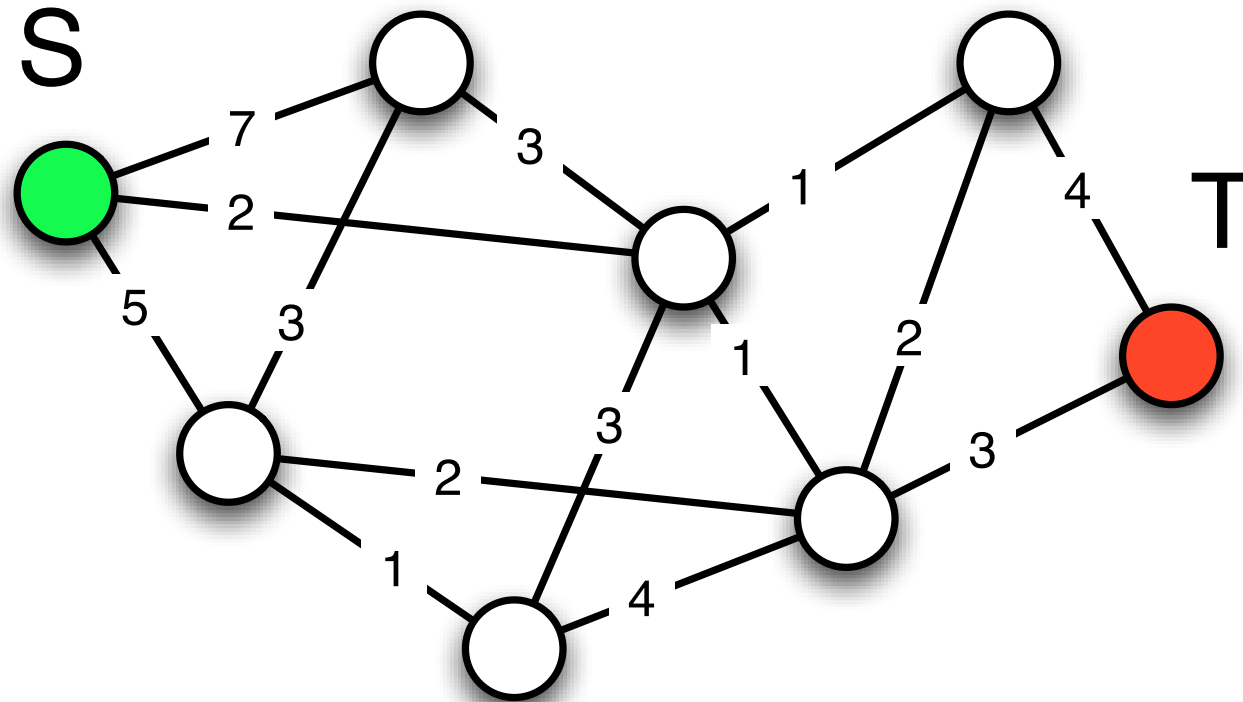
$$\sum_{v \in V} f(v, u) = \sum_{v \in V} f(u, v)$$

► Maximize flow

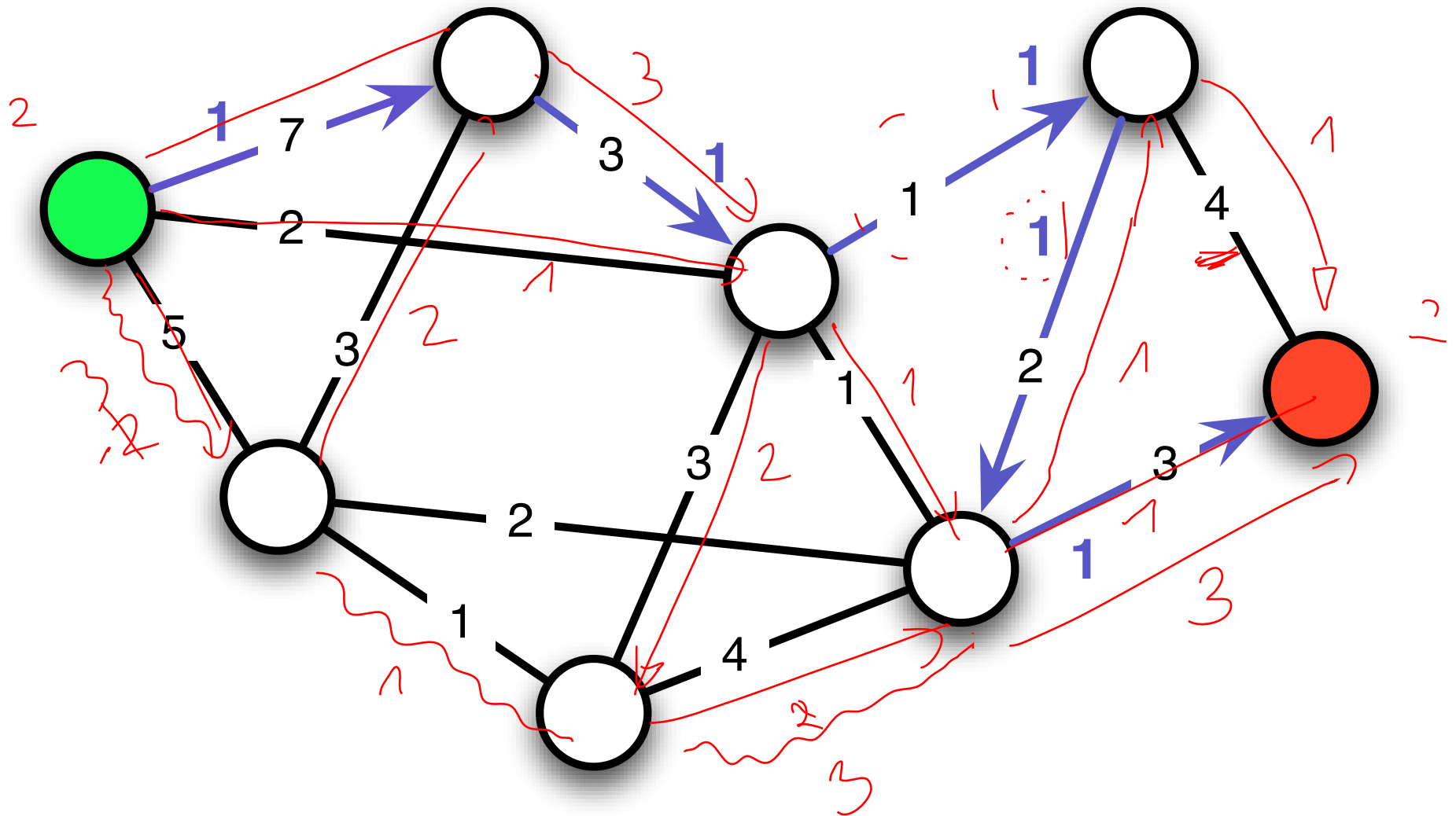
$$\sum_{u \in S} \sum_{v \in V} f(u, v)$$



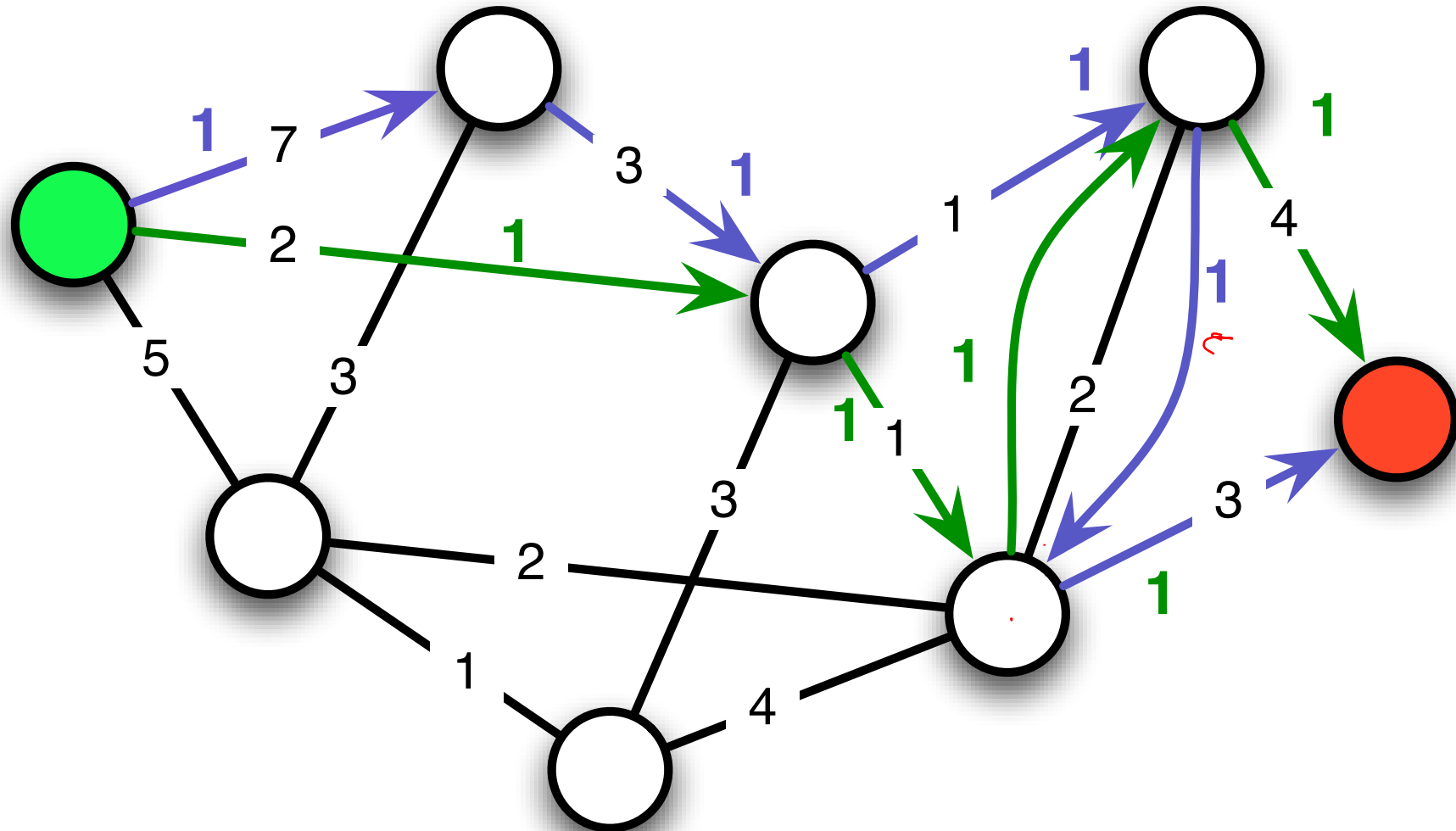
Data Flows in Networks



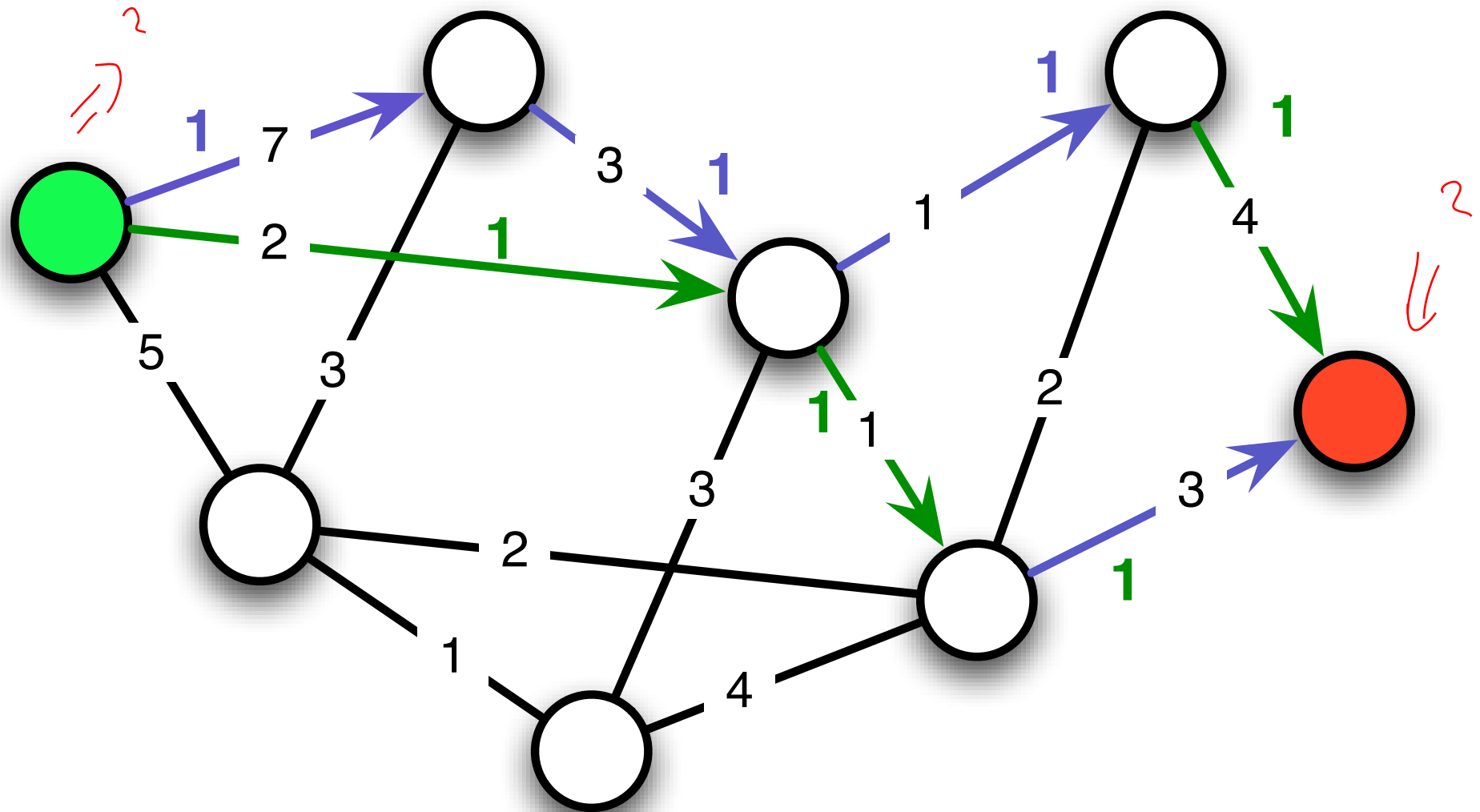
Data Flows in Networks



Data Flows in Networks



Data Flows in Networks



Computation of the Maximum Flow

► Every natural pipe system solves the minimummaximum flow problem

► Algorithms

- Linear Programming

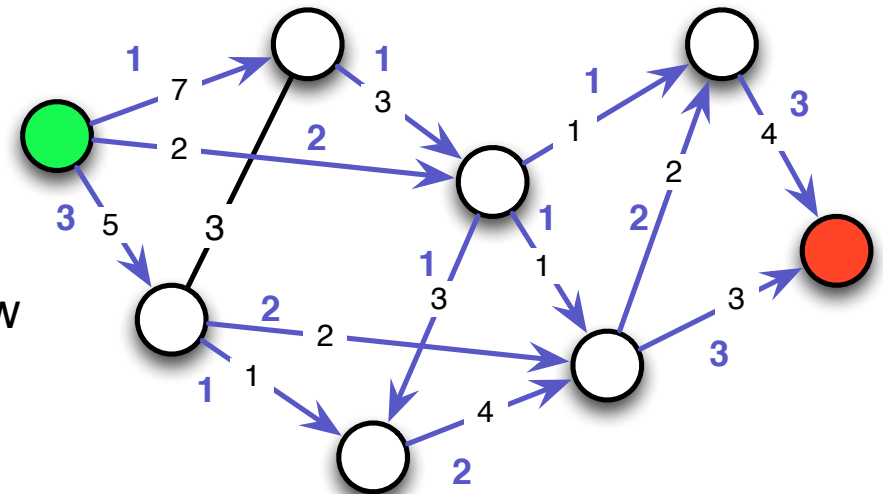
- for real numbers
- the flow is described by equations of a linear optimization problem
- Simplex algorithm (or Ellipsoid method) can solve any linear equation system

- Ford-Fulkerson

- also for integers
- as long as open paths exist, increase the flow on these paths
 - * open path: path which increases the flow

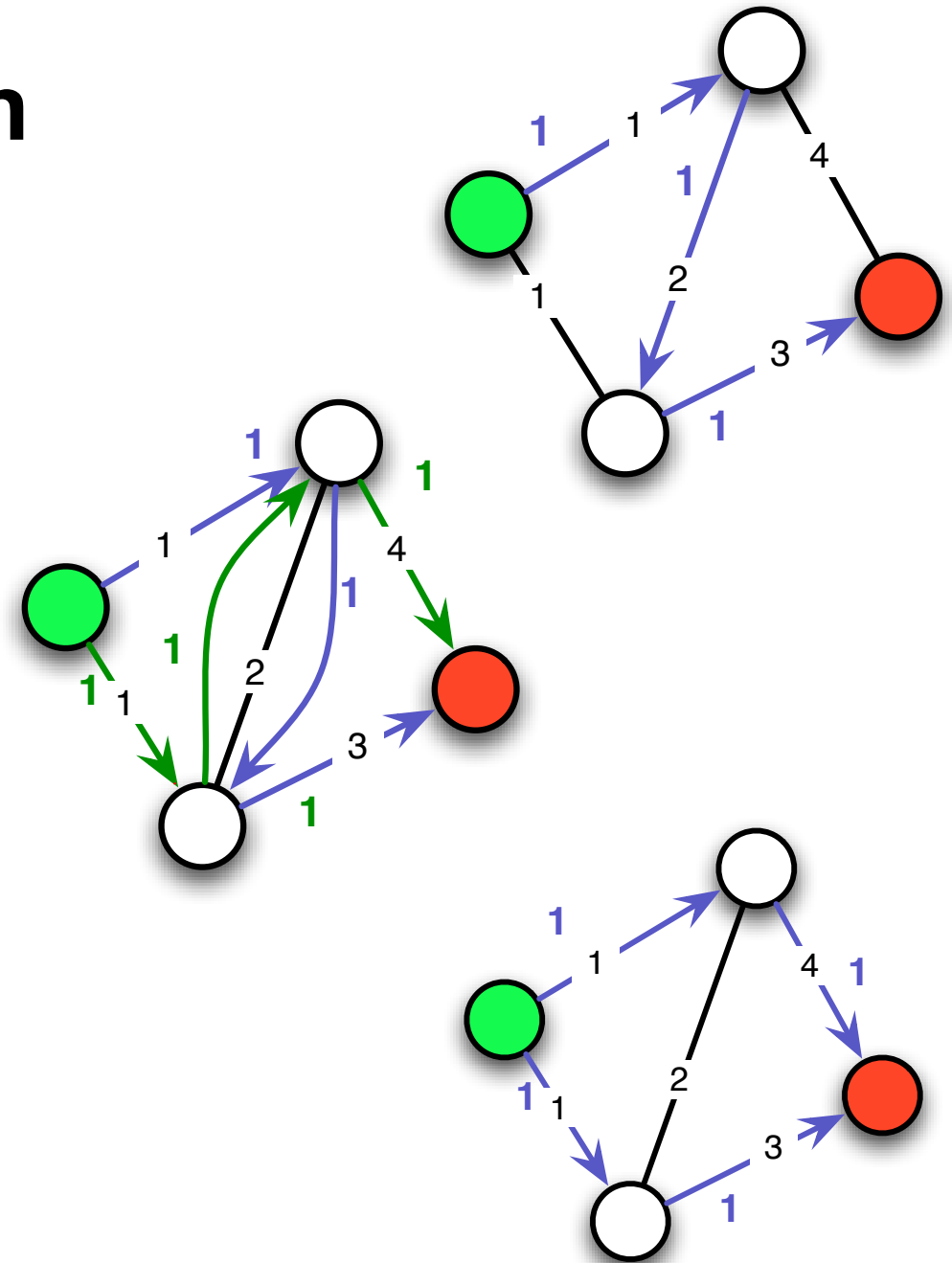
- Edmonds-Karp

- special case of Ford-Fulkerson
- use BFS (breadth first search) to find open paths



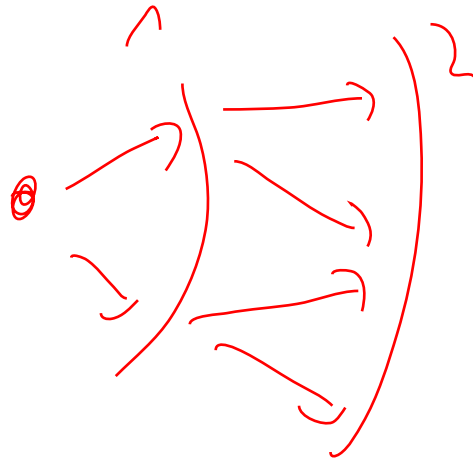
Ford-Fulkerson

- Find a path from the source node to the target node
 - where the capacity is not fully utilized
 - or which reduces the existing flow
- Compute the maximum flow on this augmenting path
 - by the minimum of the flow that can be added on all paths
- Add the flow on the path to the existing flow
- Repeat this step until no flow can be added anymore

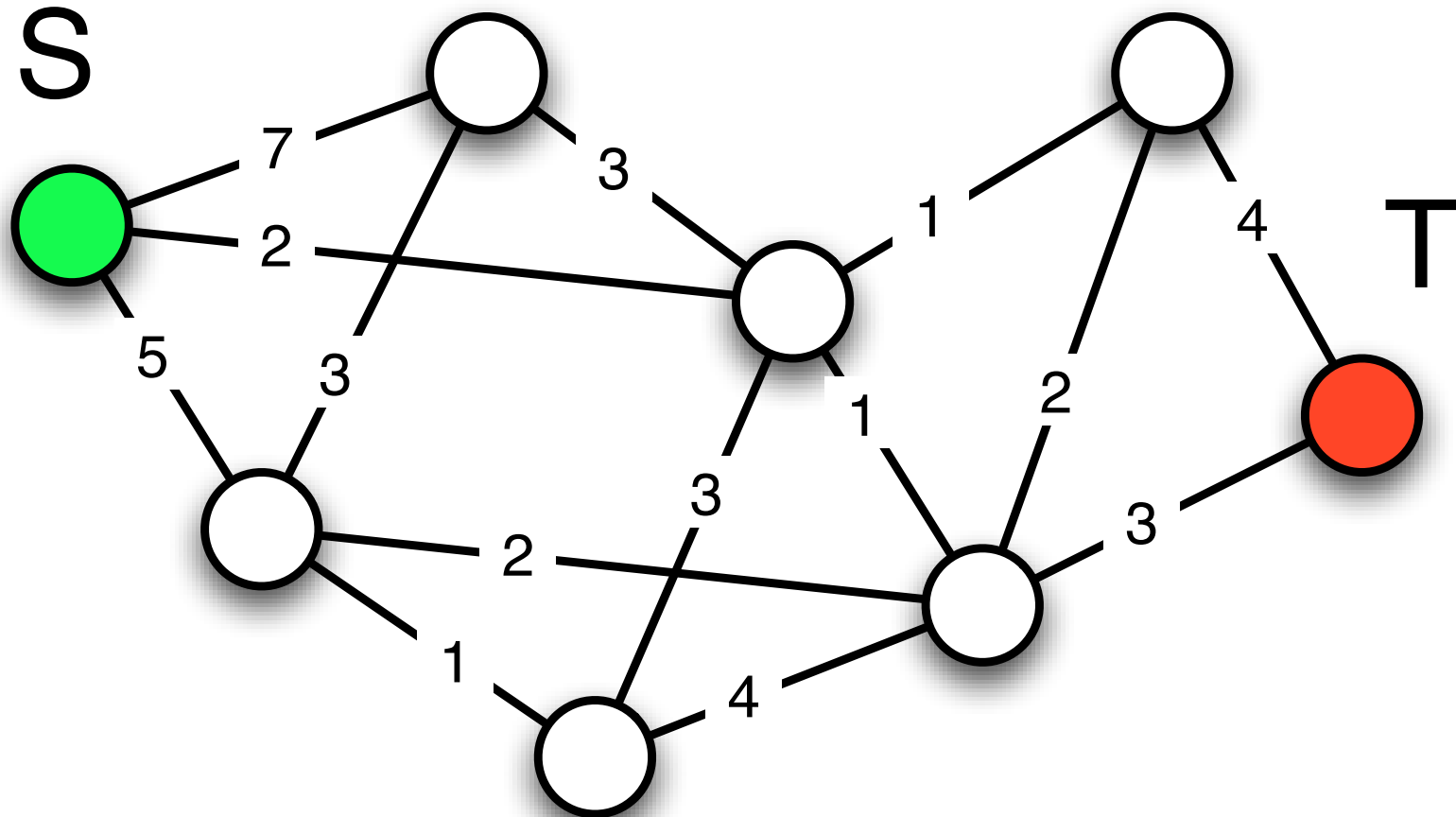


Edmunds-Karp

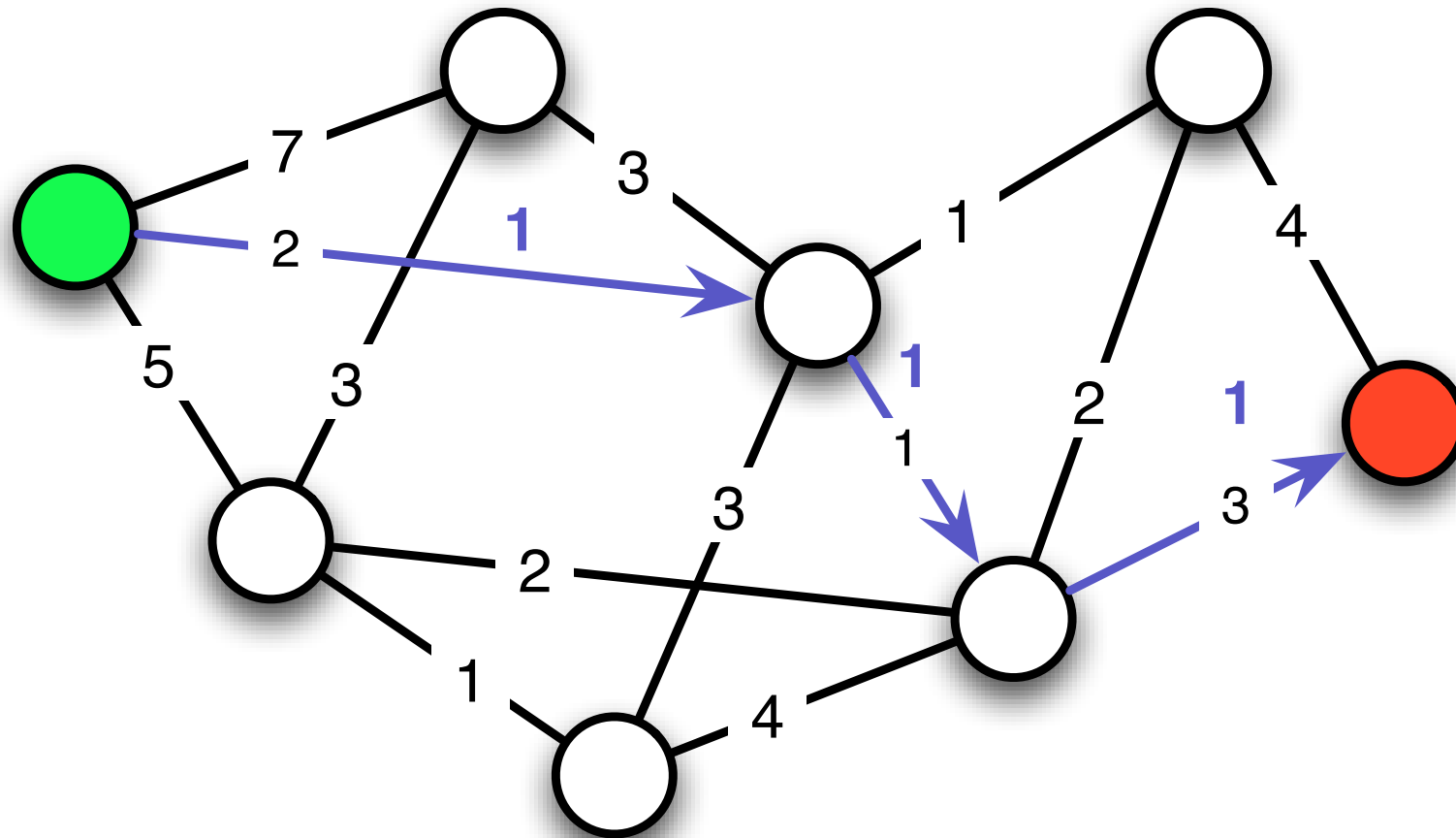
- Search path for Ford-Fulkerson algorithm
- Choose the shortest augmenting path
 - Computation by breadth-first-search
- leads to run-time $O(|V| |E|^2)$
 - whereas Ford-Fulkerson could have exponential run-time



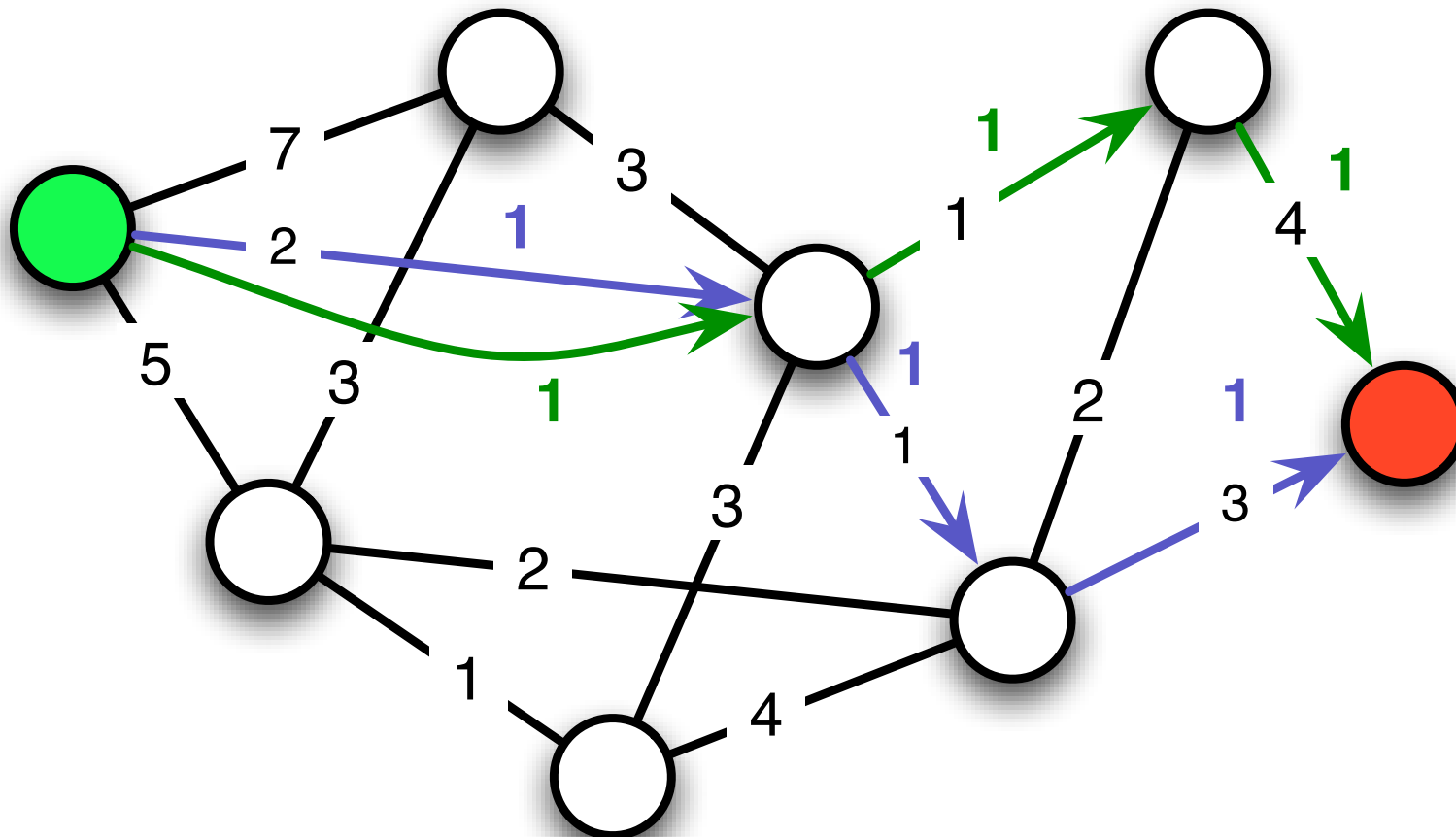
Example



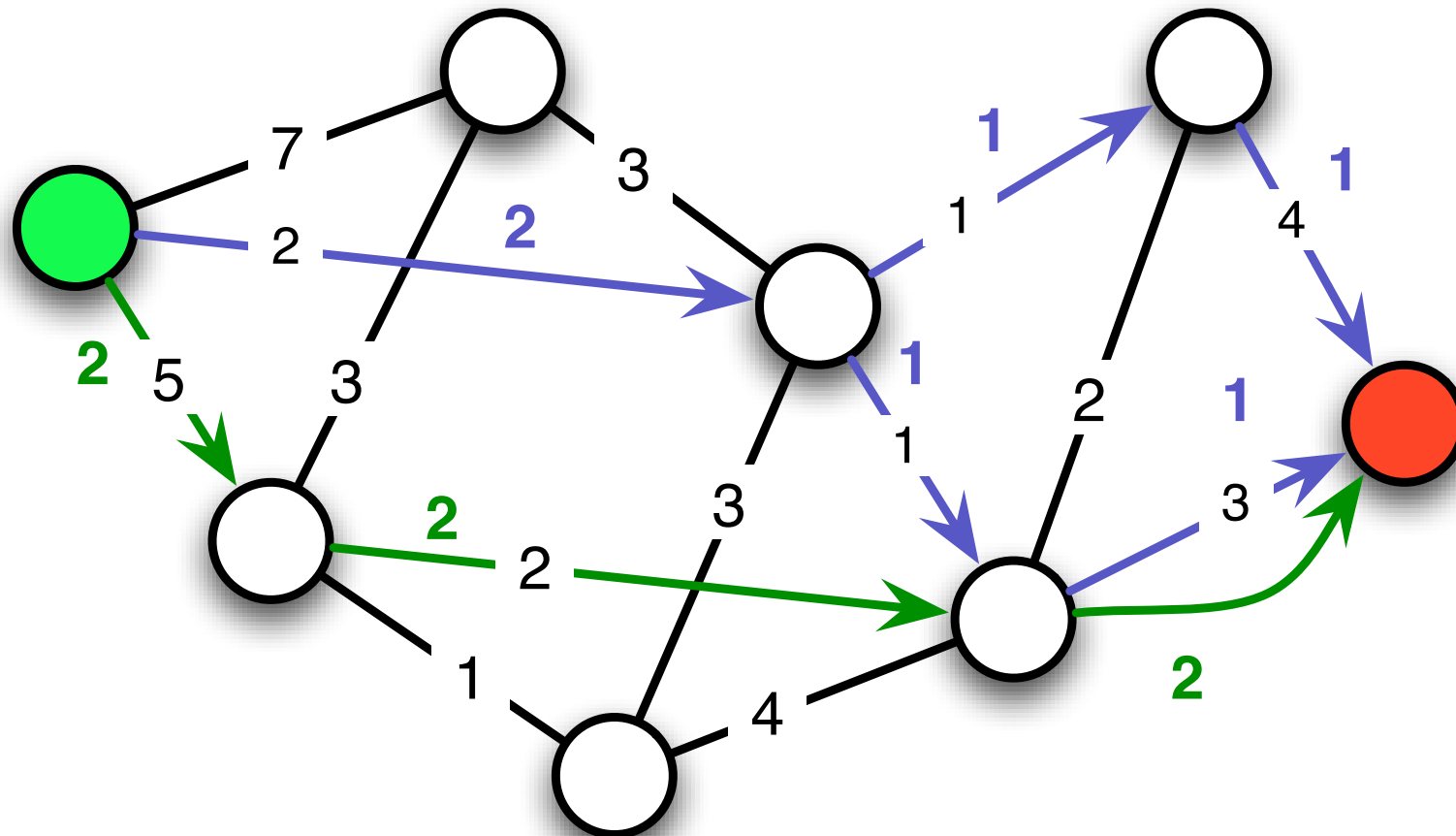
Example



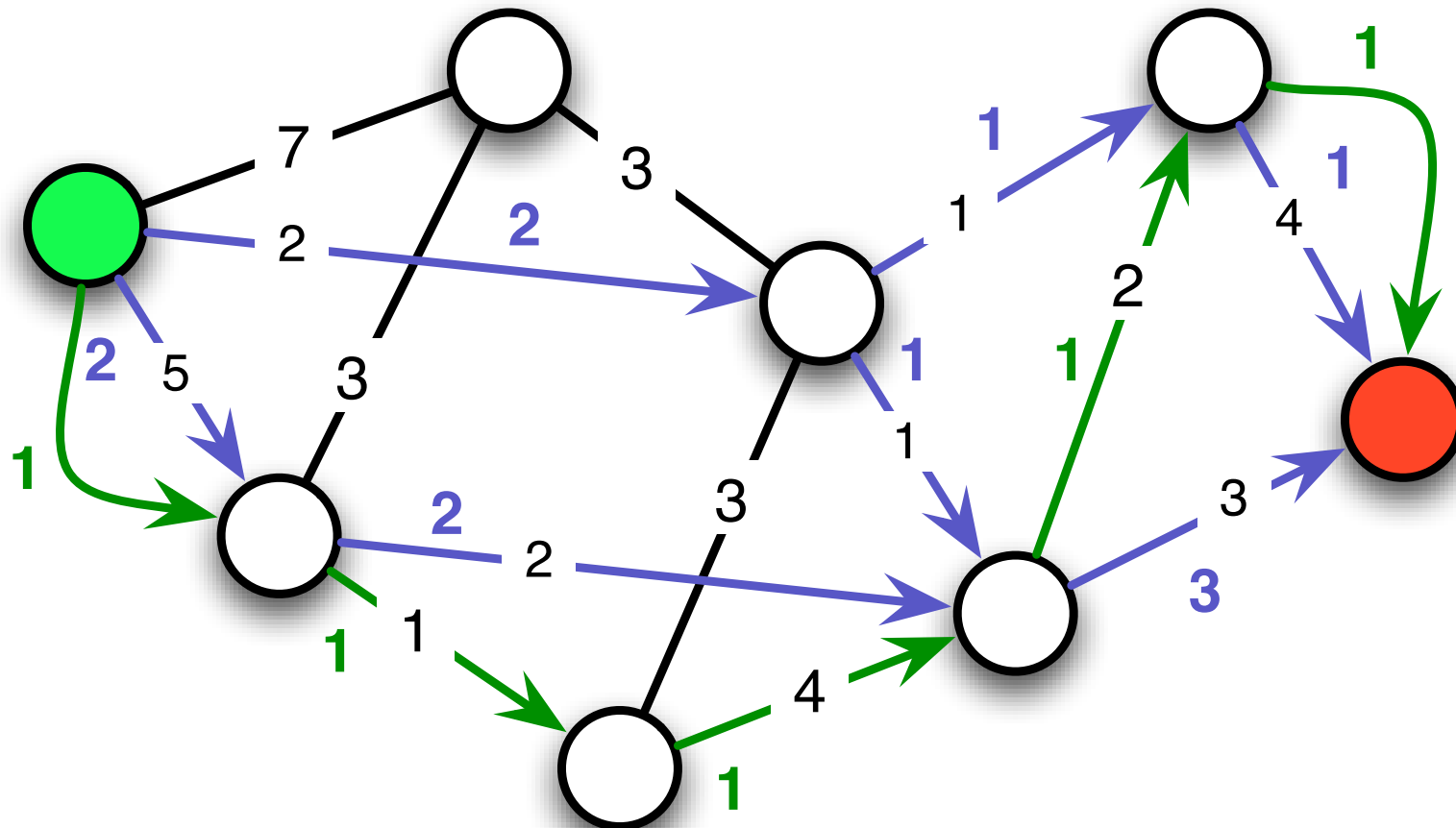
Example



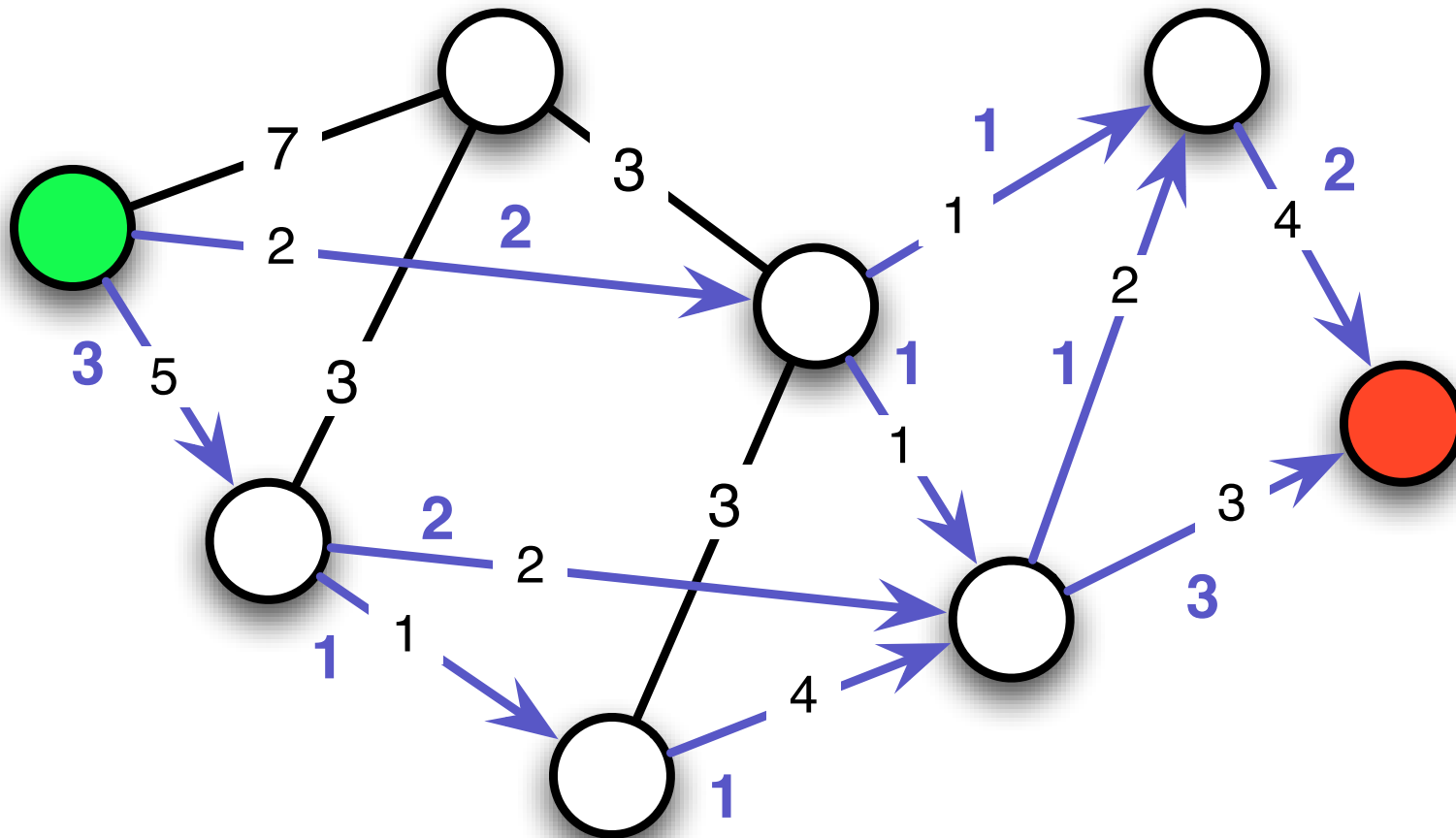
Example



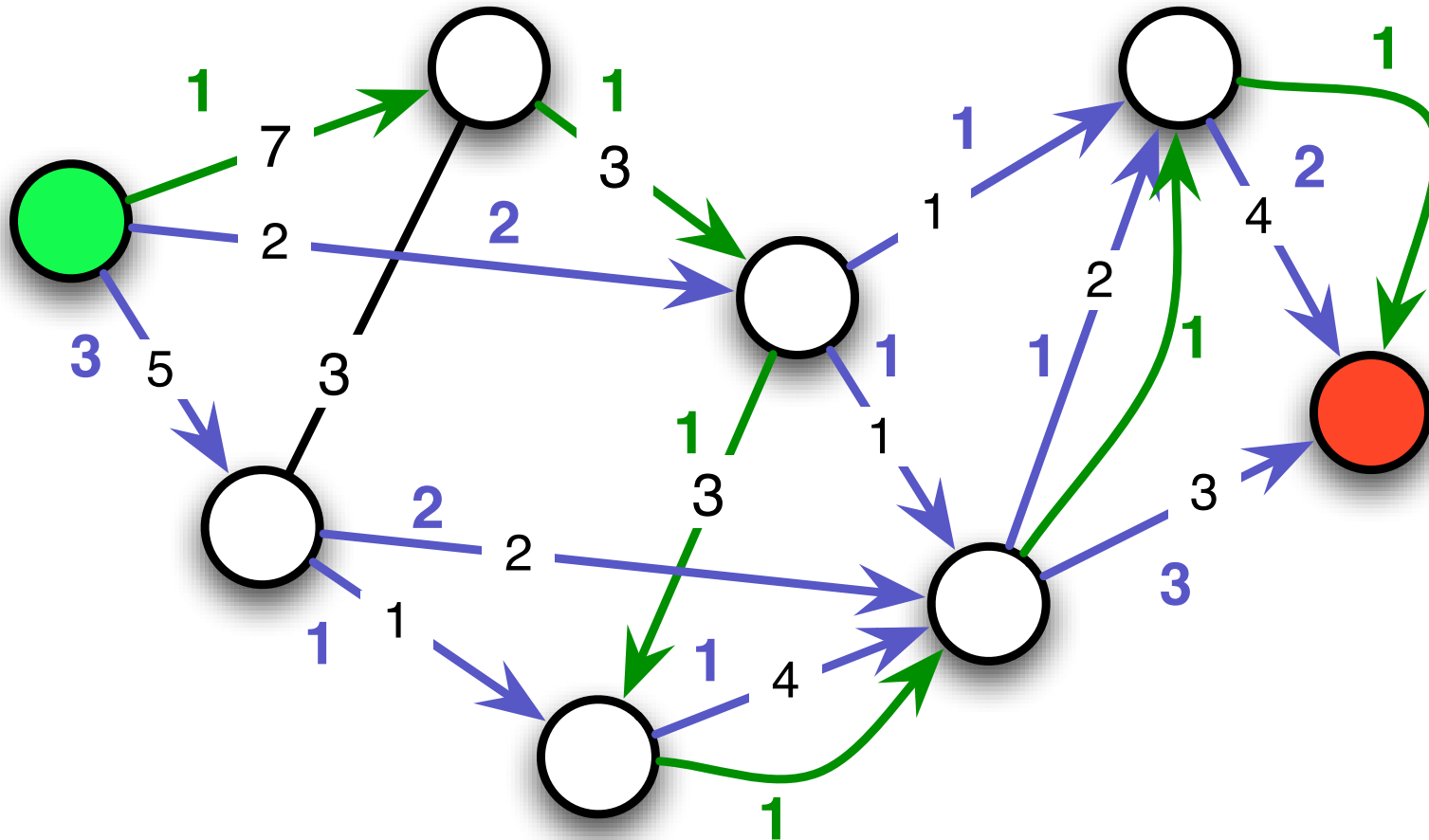
Example



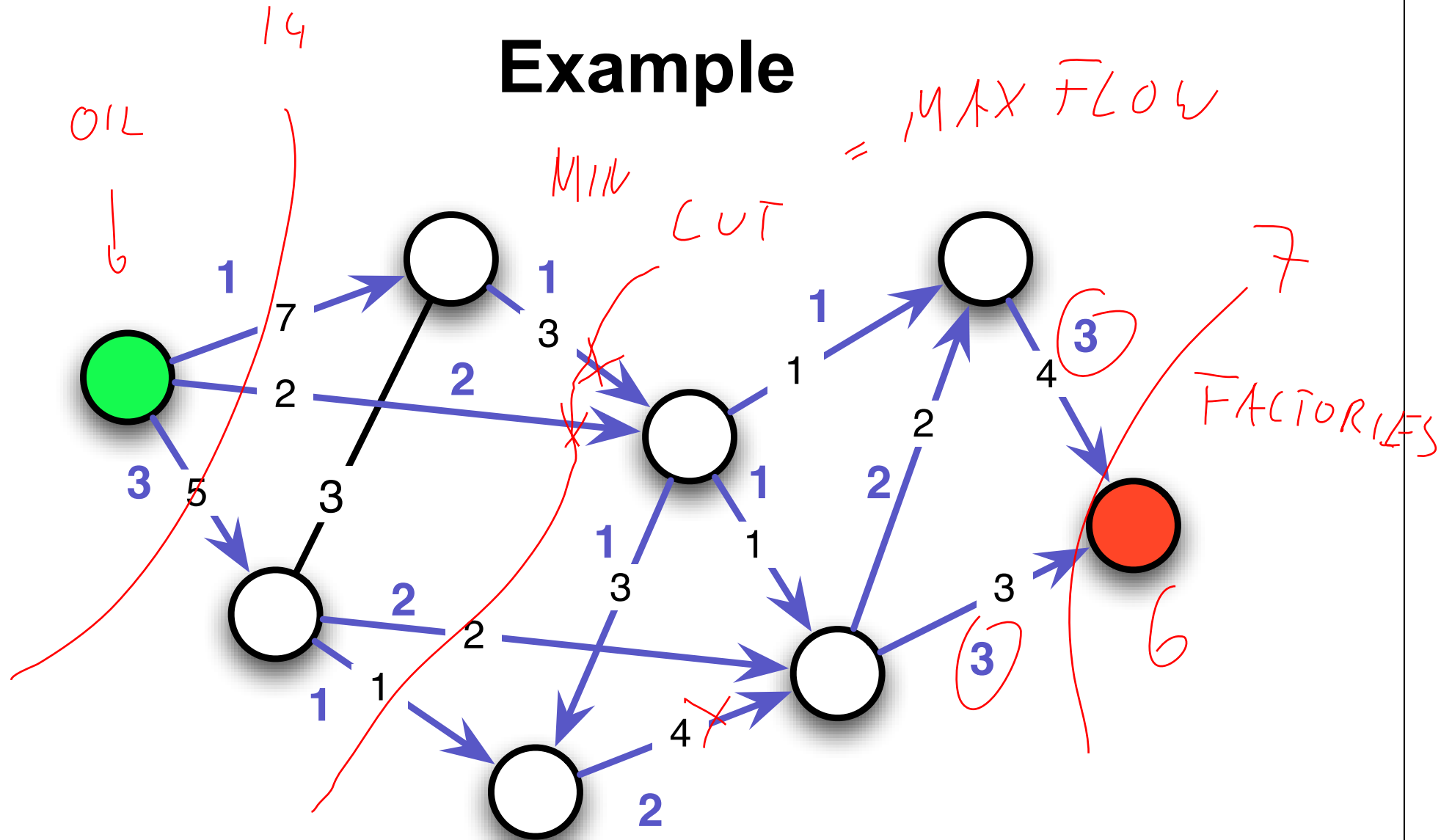
Example



Example



Example



Minimum Cut in Networks

► Motivation

- Find bottleneck in networks

► Definition

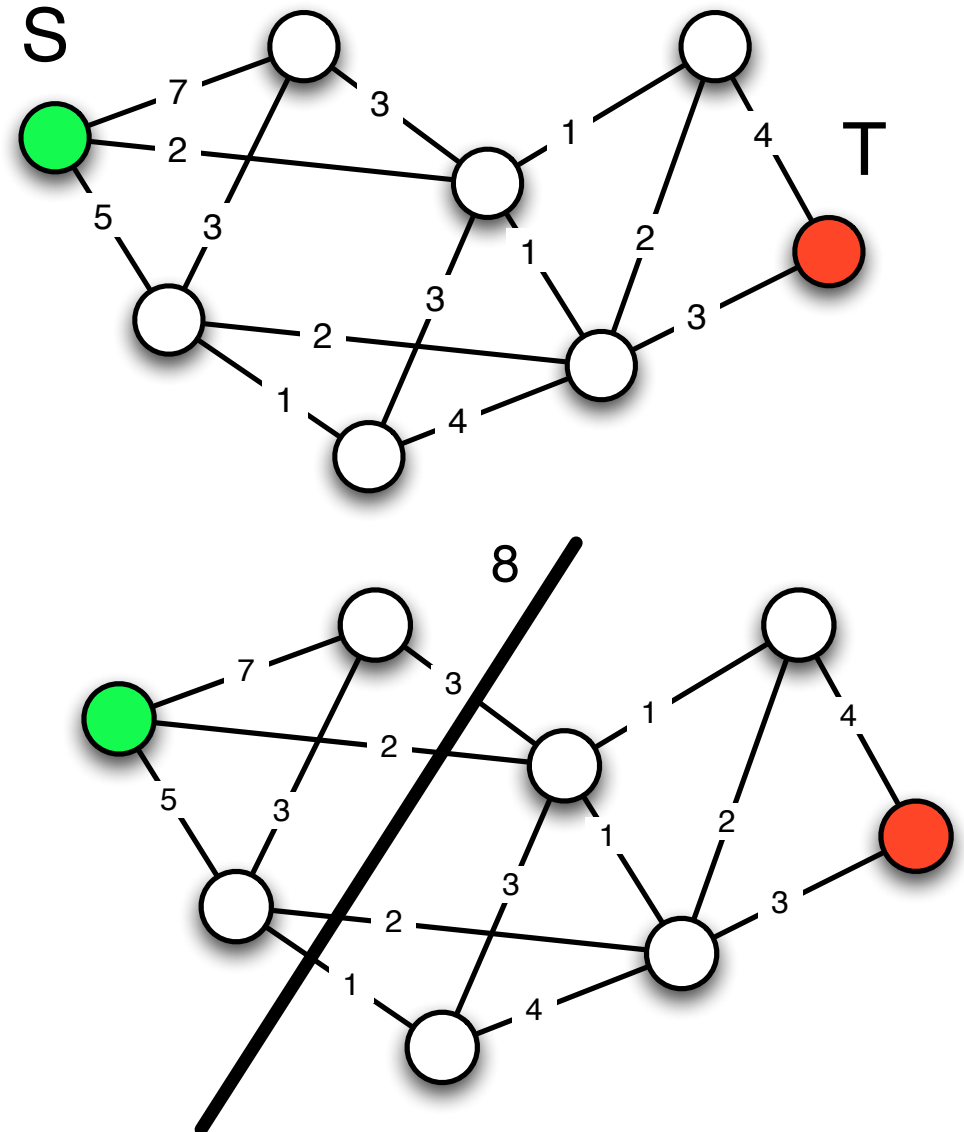
- Min Cut problem
- Given
 - graph $G=(V,E)$
 - capacity function $w: E \rightarrow \mathbb{R}^+$,
 - sources S and targets T
- Find minimum cut between S and T

► A cut C is a set of edges

- such that every path from a node of S to a node of T , contains an edge of C

► The size of a cut is

$$\sum_{e \in C} w(e)$$



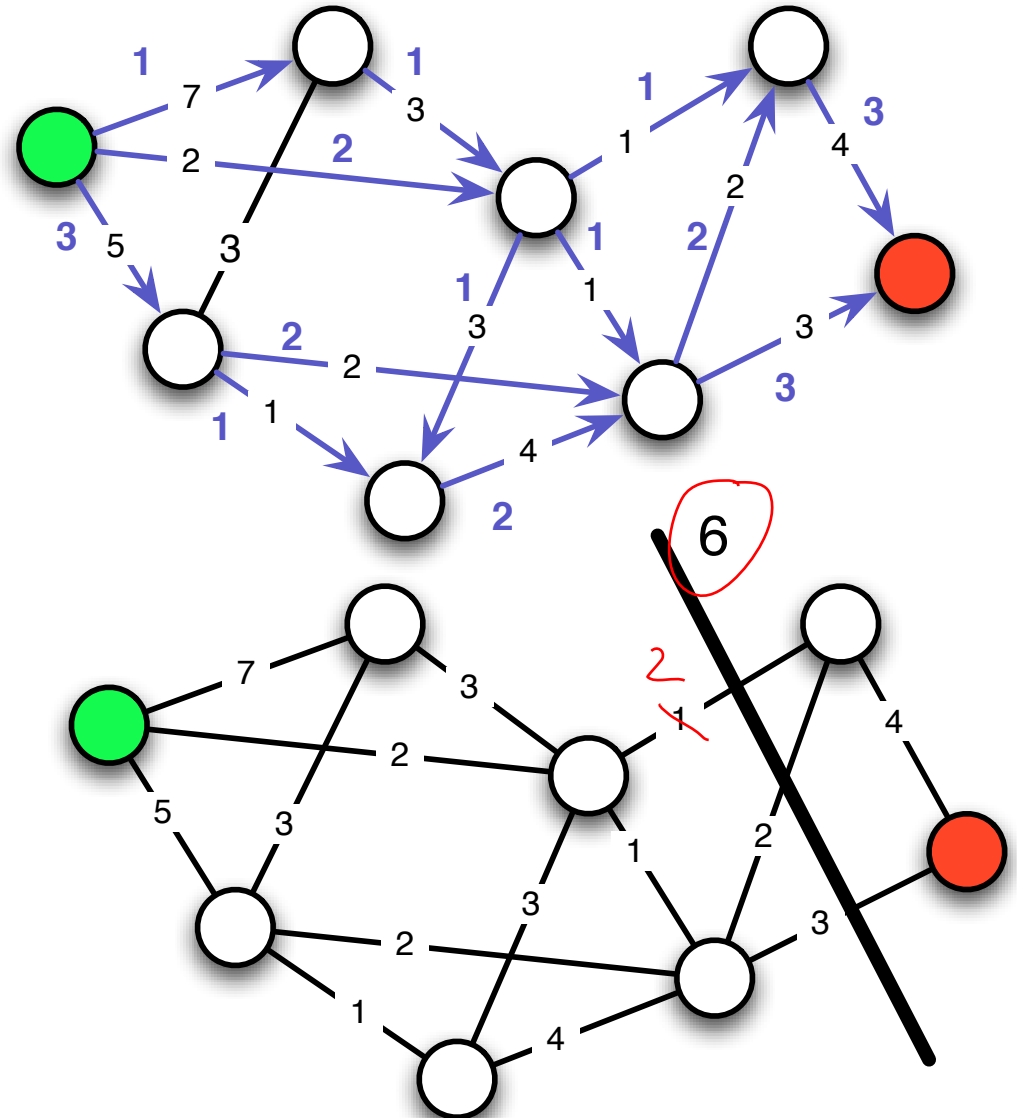
Min-Cut-Max-Flow Theorem

► Theorem

- The minimum cut equals the maximum flow

► Algorithms for minimum cut

- can be obtained from the maximum flow algorithms



Multi-Commodity Flow Problem

► Motivation

- theoretical model for point to point communication

► Definition

- Multi-commodity flow problem
- given
 - a graph $G=(V,E)$
 - a capacity function $w: E \rightarrow \mathbb{R}^+$,
 - commodities K_1, \dots, K_k :
 - * $K_i=(s_i, t_i, d_i)$ with
 - * s_i : source node
 - * t_i : target node
 - * d_i : demand

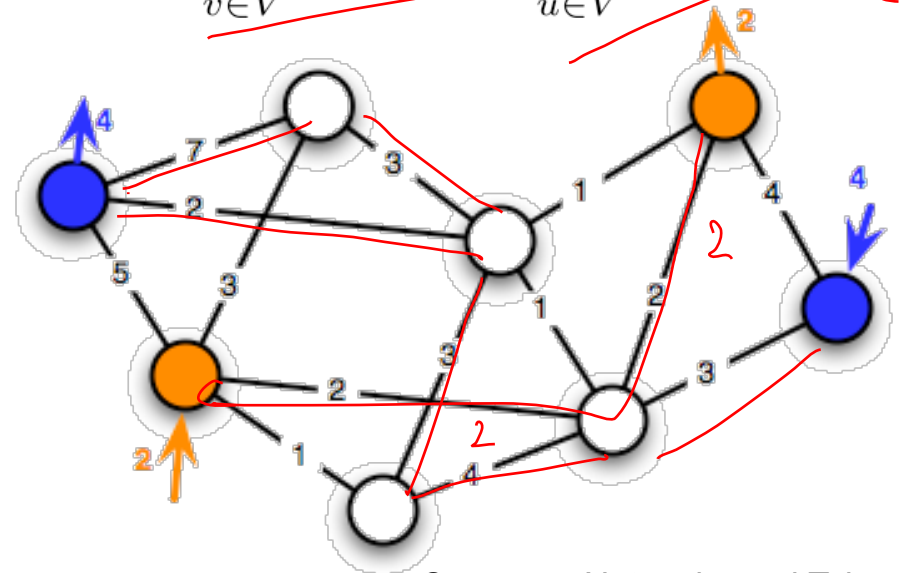
► Find flows f_1, f_2, \dots, f_k for all commodities such that

- capacities $\sum_{i=1}^k f_i(u, v) \leq w(u, v)$
- flow property

$$\forall v \notin \{s_i, t_i\} : \sum_{u \in V} f_i(u, v) = \sum_{u \in V} f_i(v, u)$$

demand

$$\sum_{v \in V} f_i(s_i, v) = \sum_{u \in V} f_i(u, t_i) = d_i$$



Solving the Multi-Commodity Flow Problem

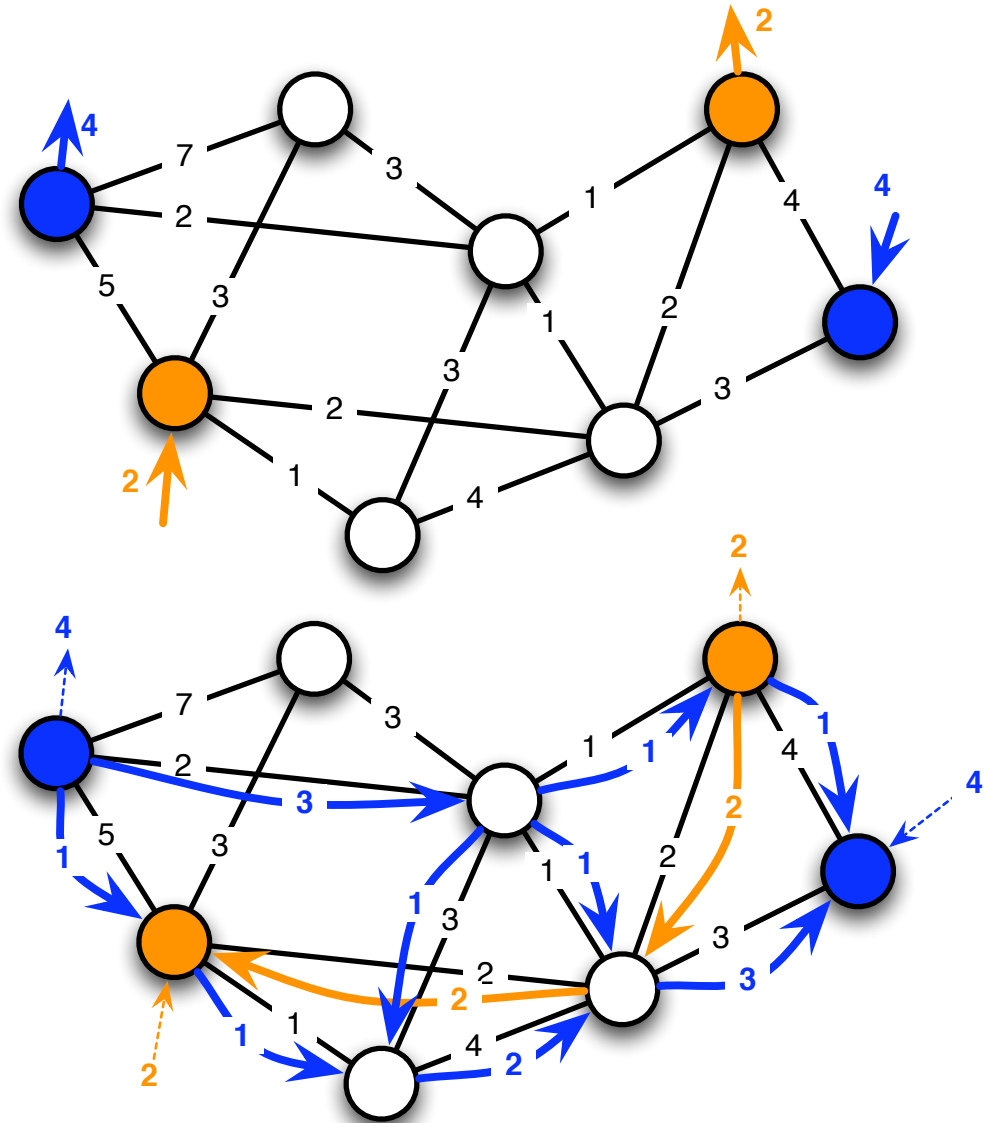
► Multi-Commodity Flow Problem

► Optimize

- sum of all flows or
- maximize the worst ratio between commodity and the demand

- ▶ **Problem can be solved in polynomial time**

- for real numbers
- using linear programming



Complexity of the Multi Commodity Flow Problem

► Problem is NP-complete

- for integers
 - e.g. packets
- even for two commodities
 - Shai, Itai, Even, 1976

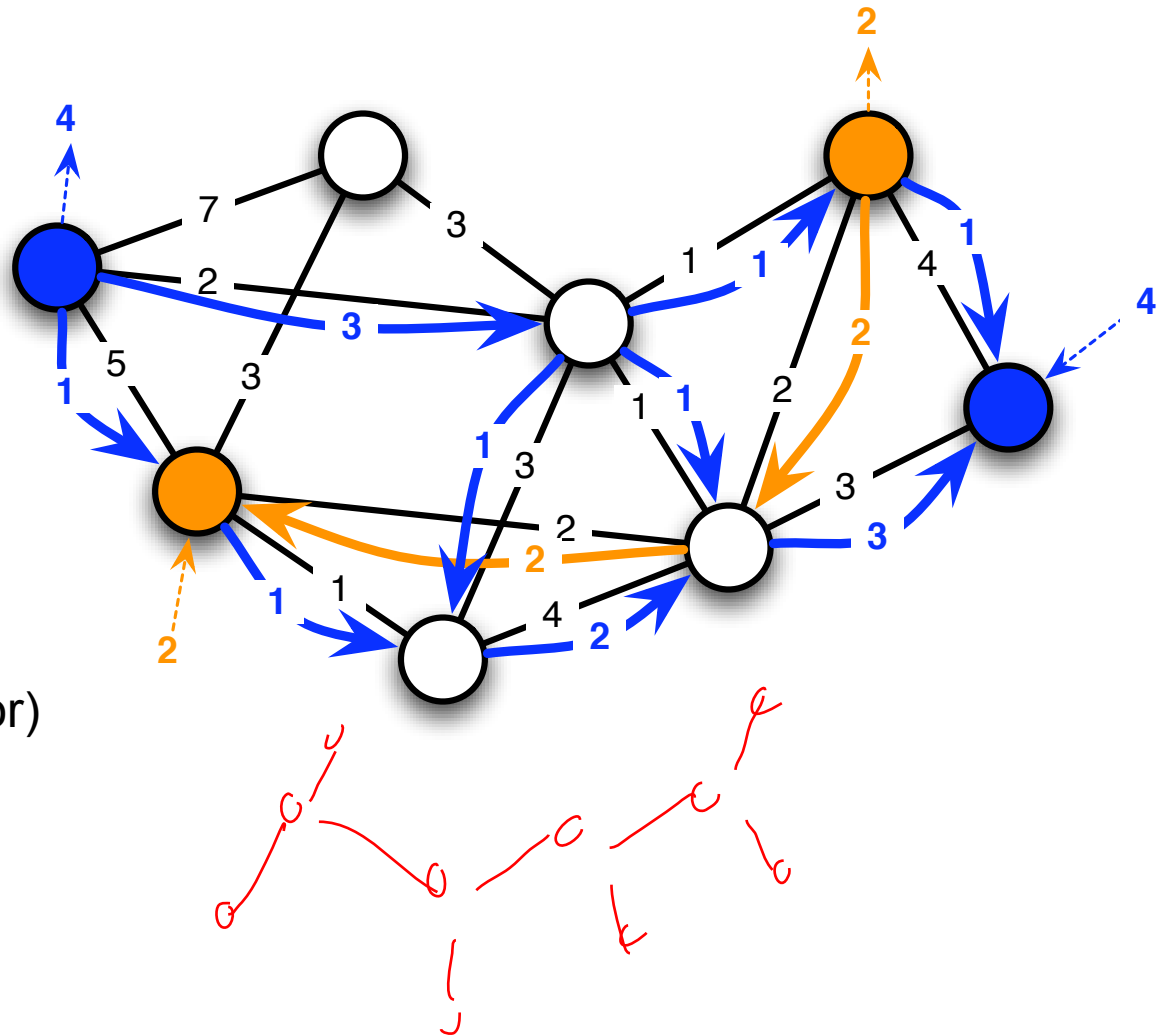
► Polynomial solution

- with respect to the number of paths between sources and targets

► Approximation

- good central and distributed approximation algorithms exist (polylogarithmic approximation factor)

► Weaker forms of the Min-Cut-Max-Flow-Theorems exist



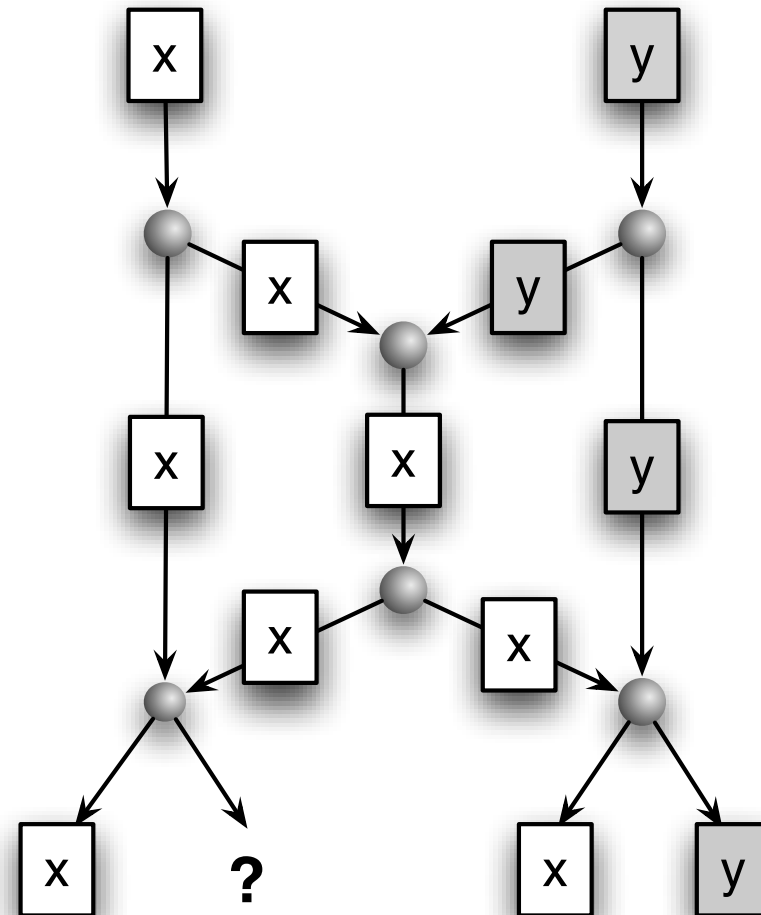
Network Coding

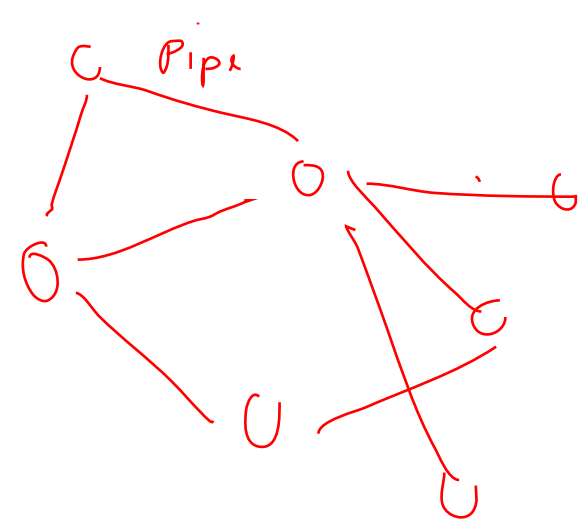
► **R. Ahlswede, N. Cai, S.-Y. R. Li, and R. W. Yeung**

- *Network Information Flow*, (IEEE Transactions on Information Theory, IT-46, pp. 1204-1216, 2000)

► **Example**

- Bits x and y are to be transferred
- Each edge carries only a bit
- If bits are transferred as is
 - then both x and y cannot be received either on the left or right side





→ TCP/IP

→ Flow problem

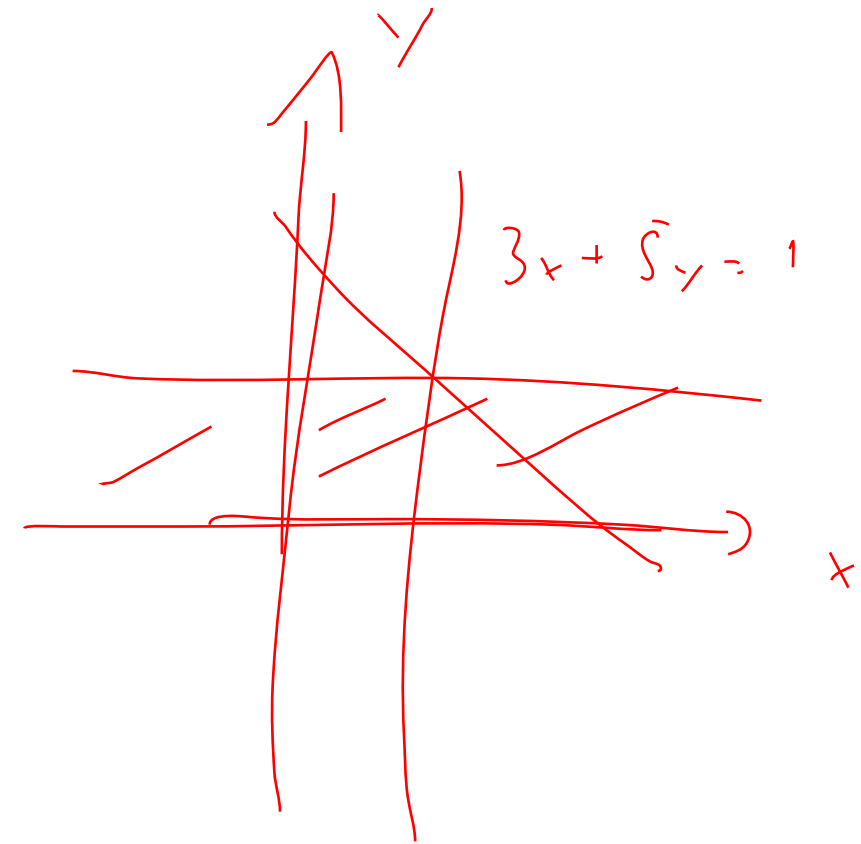
$$3x + 5y = 1$$

$$x \leq 10$$

$$x \geq 0$$

$$y \leq 15$$

$$y \geq 0$$



$$\arg \max_{x, y} [2x - y]$$

WEB-SERVER

You

Flow

